

**North Sea**



**Measurement Workshop**

**1998**

**PAPER 29**

**FOCUS DISCUSSION GROUP F**

**MEASUREMENT UNCERTAINTY**

**M Basil, Flow Ltd**

**The Application of Monte Carlo Simulation to  
Measurement Uncertainty**

**Martin Basil**

of



**FLOW Ltd**

**16th North Sea Flow Measurement Workshop 1998**

**Gleneagles, 26-29 October 1998**



# Overview

- **Background**
- **Explanation**
- **Example**
- **Applications**



## **Background**

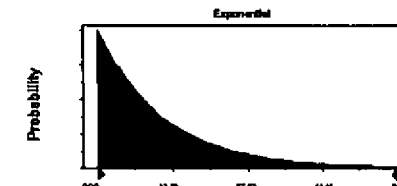
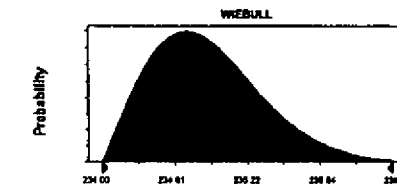
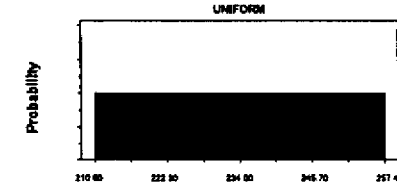
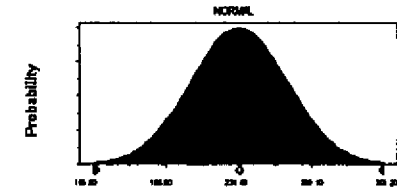
- **Wide use for risk analysis in business and industry**
- **First used in 1908 to confirm Student t-distribution**
- **First applied on the "Manhattan Project"**
- **Only method to solve some classes of problem**
- **Use limited by need for fast computers**



- **Widely used in business and on large projects for risk assessment and decision making**
- **First practical application in 1908 by William Sealy Gosset (Student) in the discovery of the correlation coefficient and later the same year to confirm his Student t-distribution findings**
- **First real application stems from development of the atomic bomb "Manhattan Project" during the second world war**
- **Until recently the need for fast computers has prevented wider application in areas such as uncertainty assessment**
-

# Explanation 1 Input Sensors

- Simulate measurement sensors
- Inputs may have any distribution
- Typically a "normal" distribution...
- ...with a "mean"
- ...and "standard deviation" based on the measurement uncertainty at a 95% confidence level i.e. 2 std. dev.



# **Explanation 2 Model**

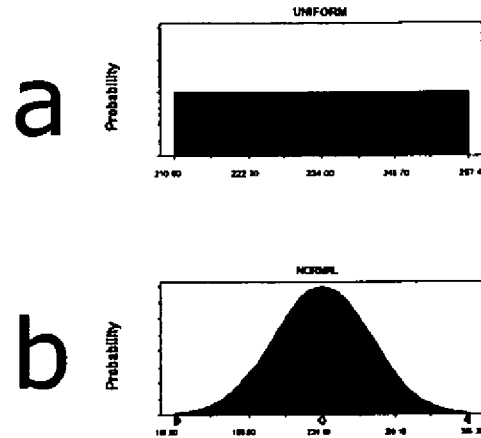
- **Simulated input sensor values are applied to a mathematical model of the measurement system**

$$x = a + b^2$$

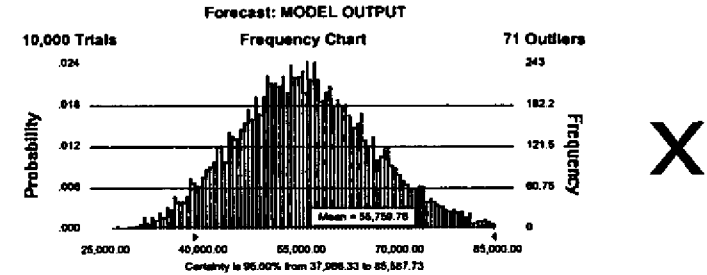
- **Repeated until sufficient trials representing most combinations of sensor values**



# Explanation 3 System Output



$$X = a + b^2$$

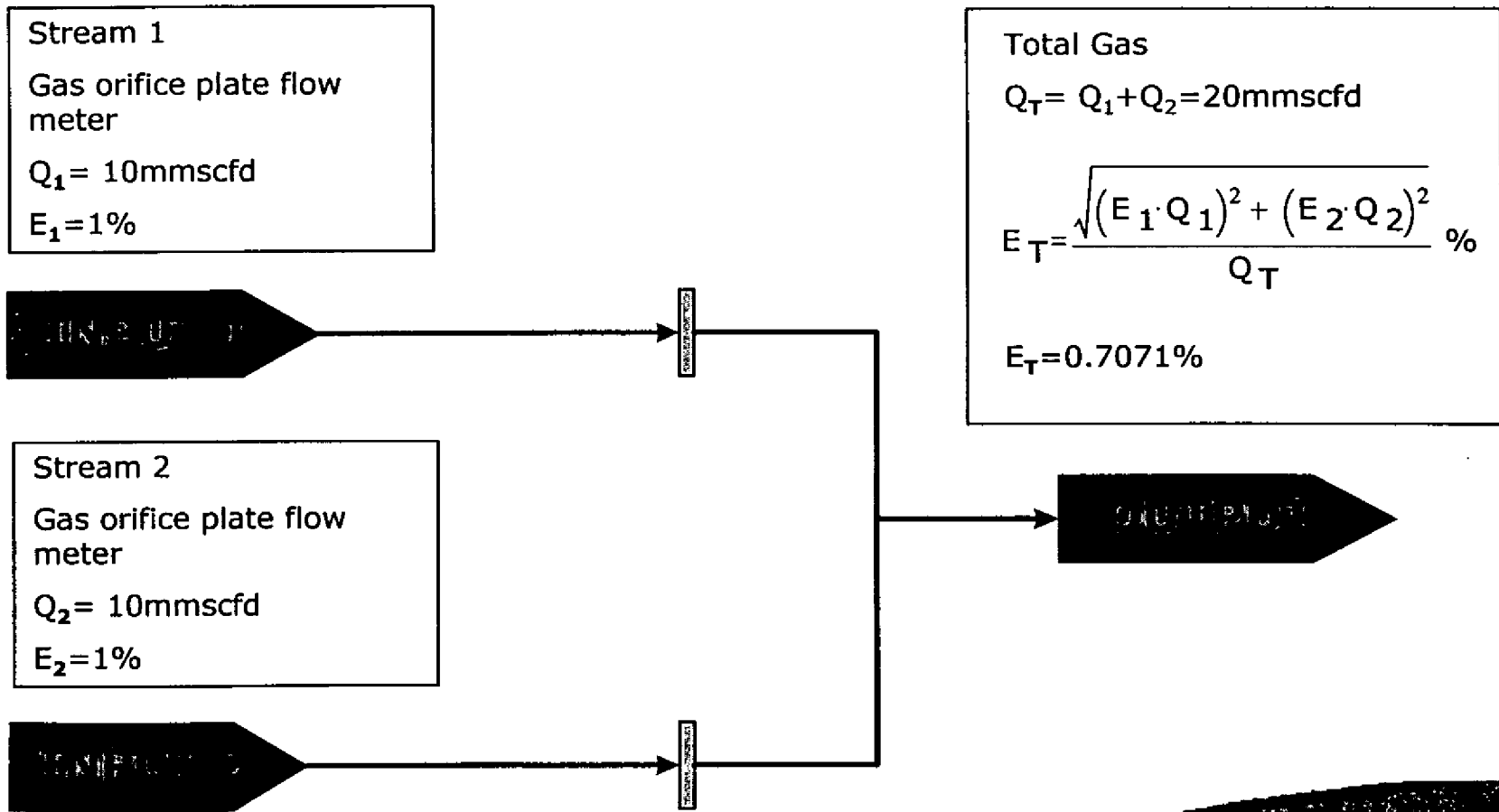


**Measurement System Output Uncertainty is found from the "mean" and "standard deviation" of the distribution X**

**i.e. Uncertainty at 95% confidence level = 2 std. dev.**

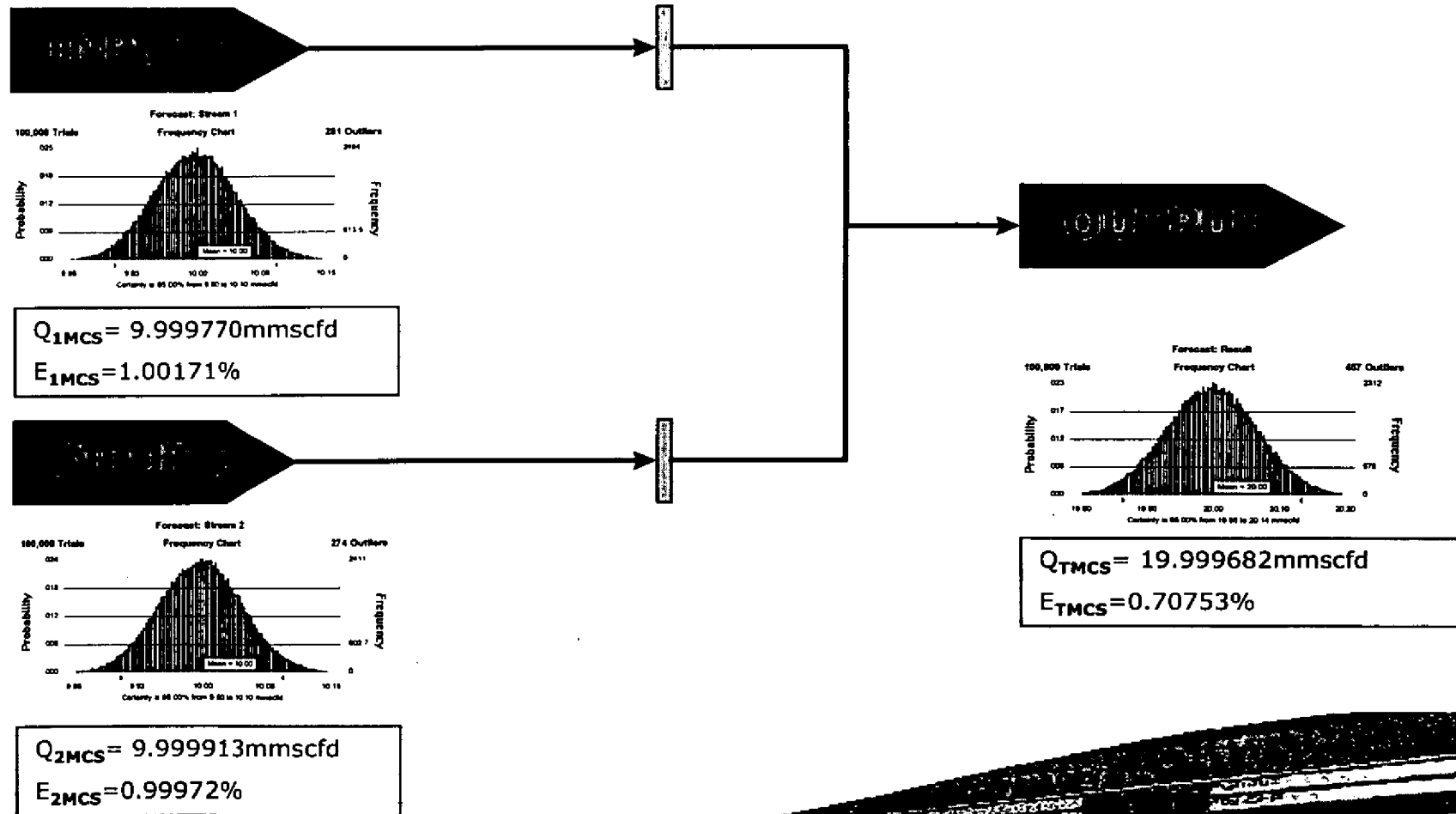


# Example Analytical Uncertainty





# Example Monte Carlo Uncertainty



# **Applications**

- **Verification of analytical methods**
- **Large number of inputs or outputs**
- **Complex calculations and Non-linear relationships**
- **Large measurement uncertainty i.e. MPM**
- **Dependant inputs**
- **Unconventional input or output distributions**

